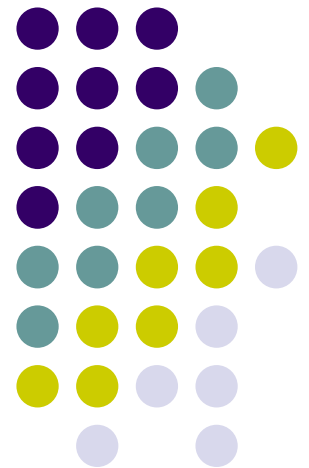
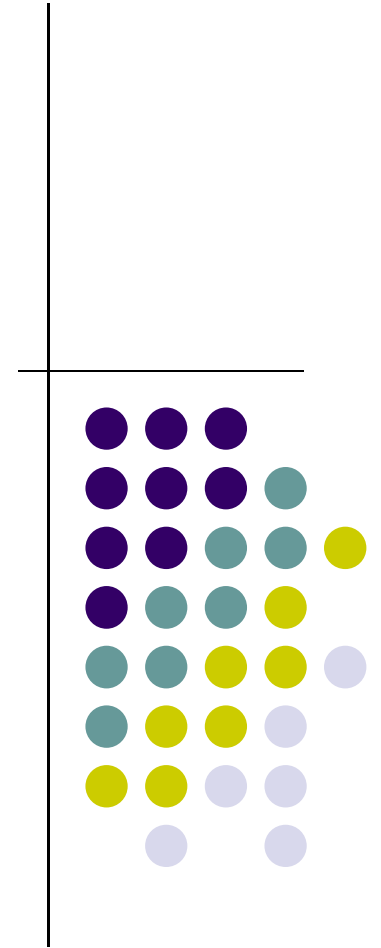


RDBMS for Environmental Observations

Bill Howe, Phd
UW eScience Institute
UW CSE





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The National **Institute** for Discovery **Science** (NIDS) is a privately funded **science institute** engaged in research of UFOs, animal mutilations, and other related anomalous phenomena.

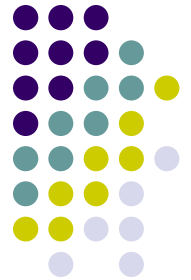
www.nidsci.org · [Cached page](#)

Background

- Phd Computer Science
 - Databases
 - Scientific Data Management
 - Unstructured Grids
- Research Scientist at CMOP
 - One of 17 NSF STCs
 - Observations and Models
- Senior Research Scientist, UW eScience
- Affiliate Assistant Professor, CSE



CMOP
Center for Coastal
Margin Observation
& Prediction





R/V Wecoma, April 2007

me

3/12/09

Bill Howe, eScience Institute



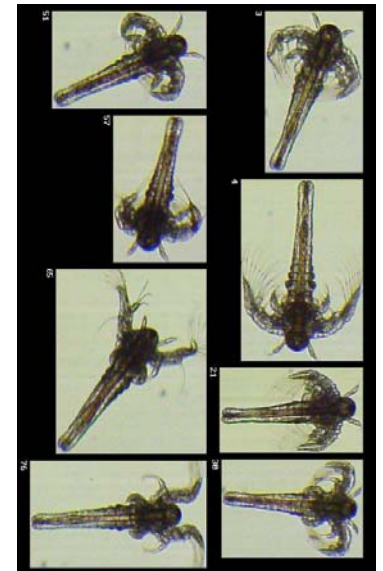
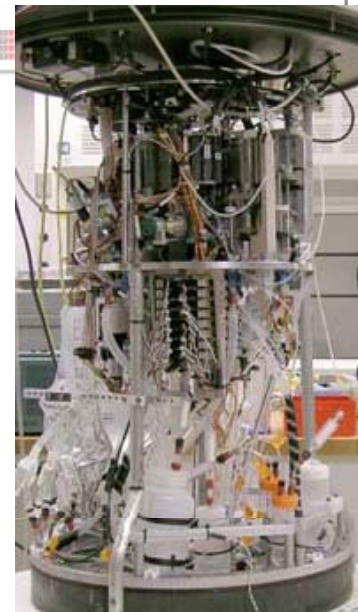
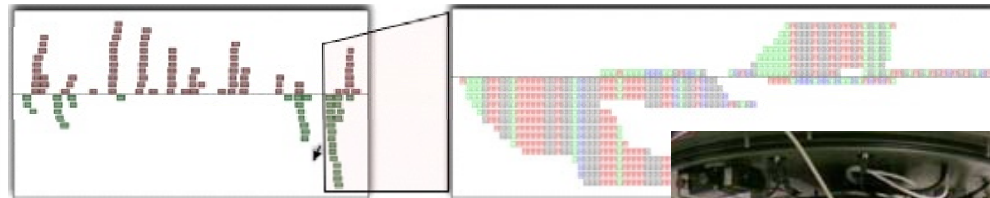
All science is reducing to querying databases

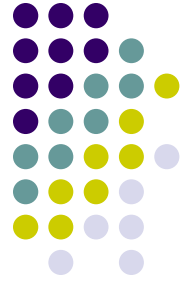


Old model: “Query the world” (Data acquisition coupled to a specific hypothesis)

New model: “Download the world” (Data acquired en masse, in support of many hypotheses)

- Astronomy: High-resolution, high-frequency sky surveys (SDSS, LSST, PanSTARRS)
- Oceanography: high-resolution models, cheap sensors, satellites
- Biology: lab automation, high-throughput sequencing,

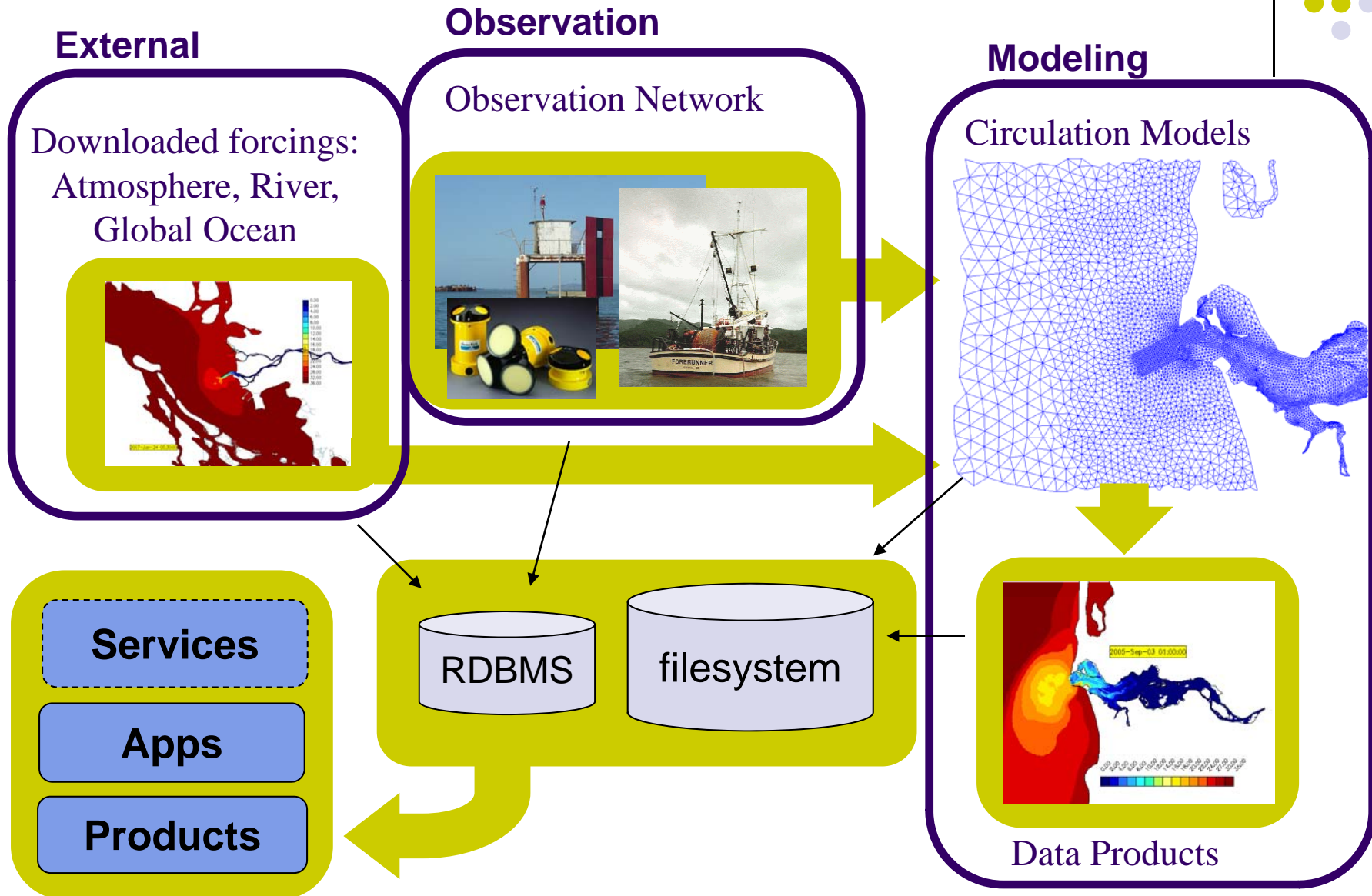
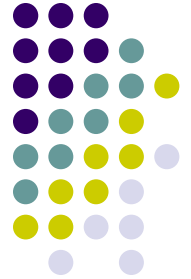




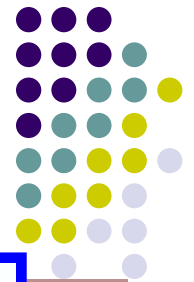
Topics

- Narrative: RDBMS at an Ocean Observatory
 - Strengths and Weaknesses
- Directions for discussion
 - Ad Hoc Databases
 - *Key discovery: SQL does not terrify scientists!*
 - Cloud computing & Database-as-a-service
 - Array-oriented Databases
 - Column-oriented Databases
 - Unstructured grids
 - Data-intensive Scalable Computing

Ex: CMOP Data Flow

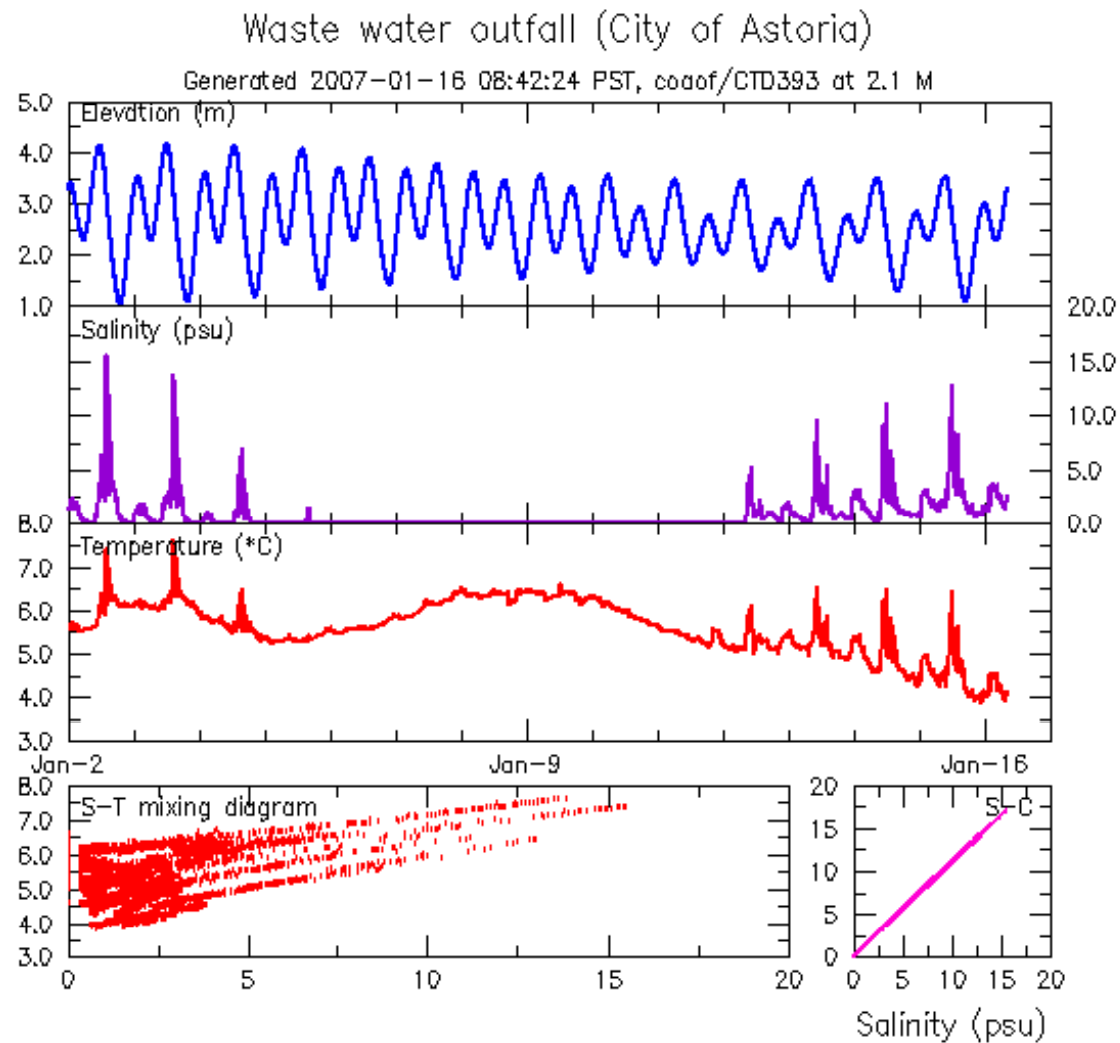


CMOP Observation Network

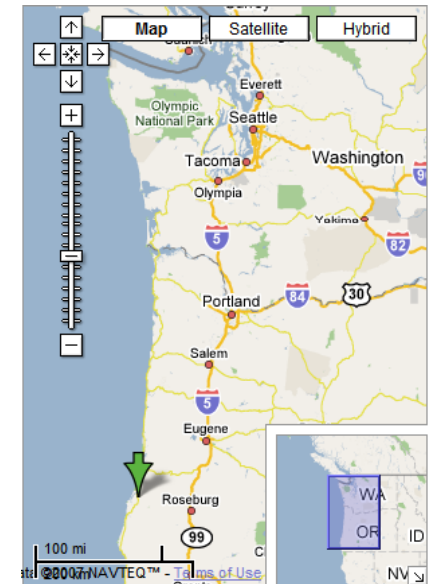
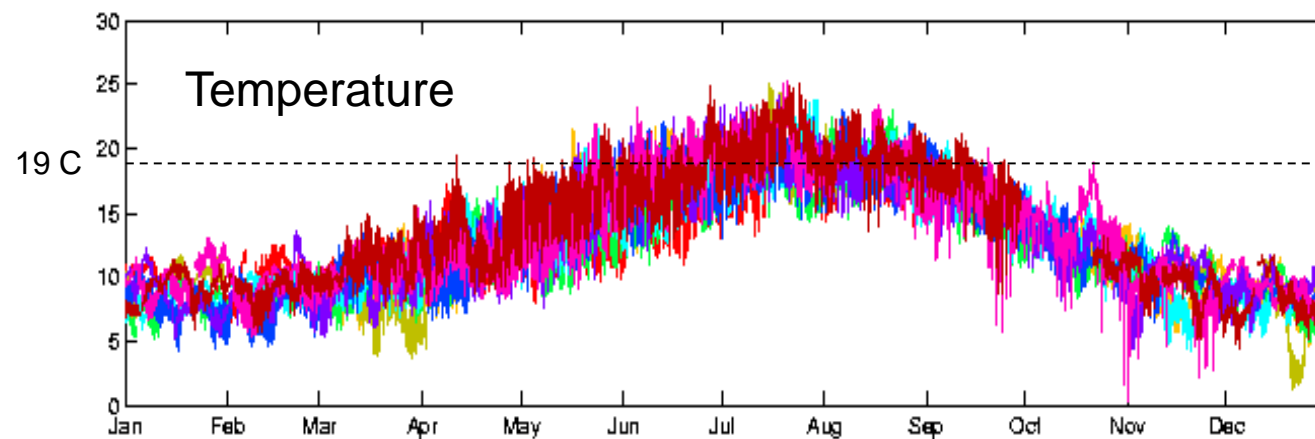
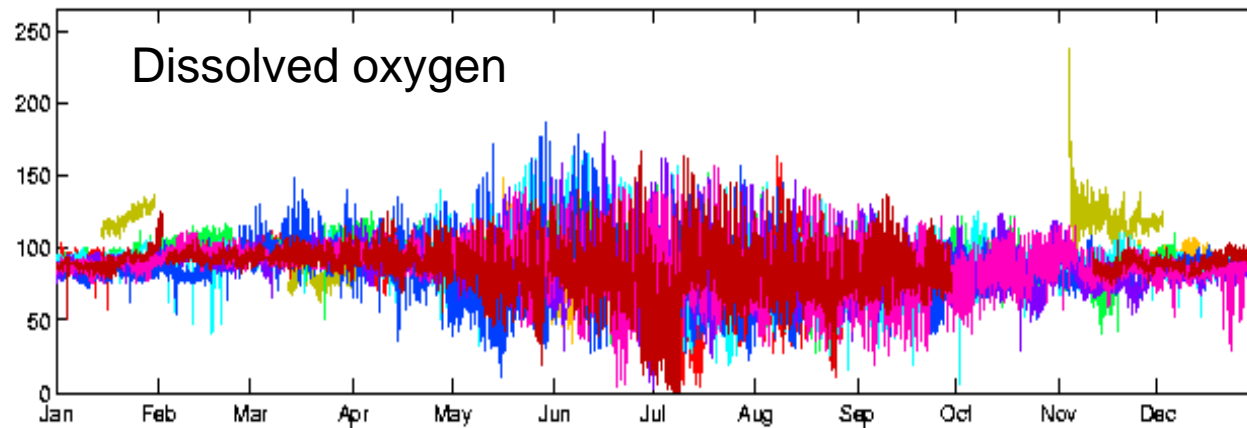




Example Products

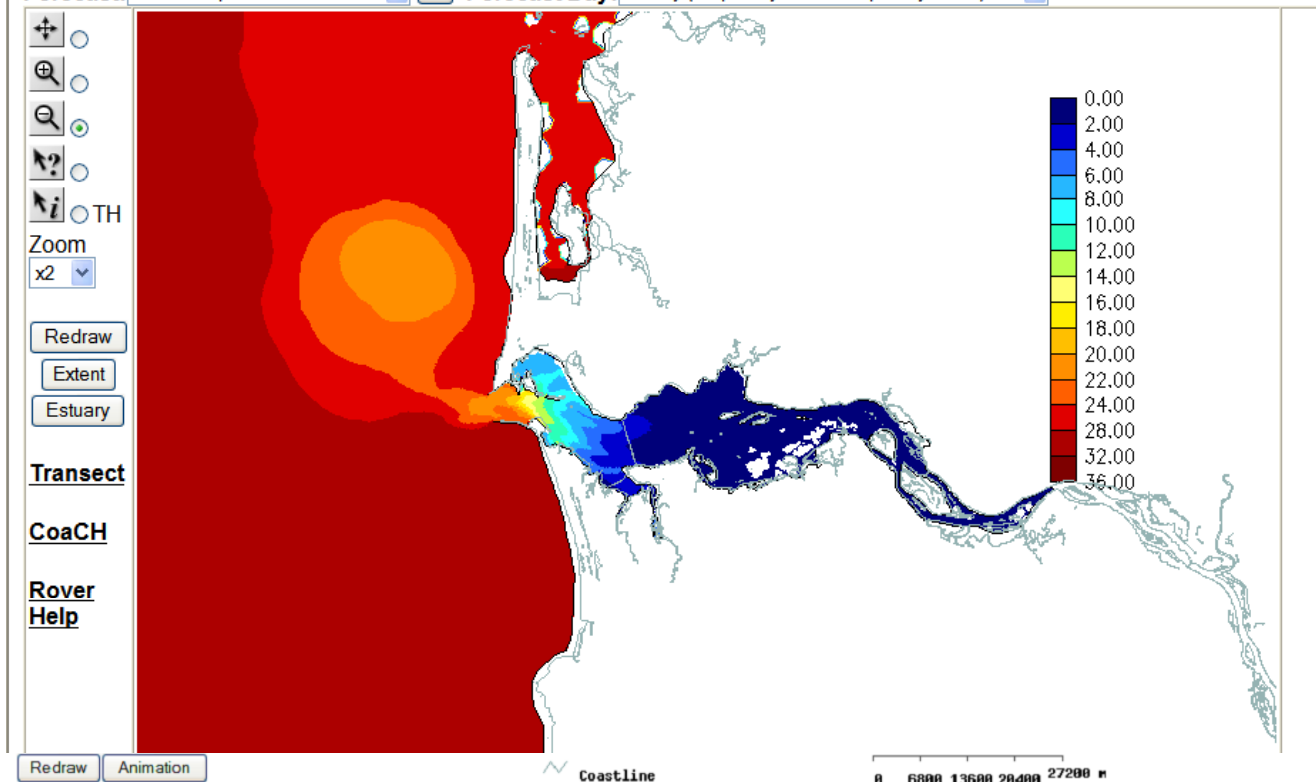


Example Products



Yearly overlay scatter plot, 1996-2004, Winchester Arm, Coos Bay, OR

Forecast: CORIE Experimental Go Forecast Day: Today (Steps day 1 = 96, Steps day 2 = 96)



Redraw Animation

Query Results:

Animation Step Control:	Start Time Step (1-192): 1	Stop Time Step (1-192): 10	Skip Time Step (> 1): 1	GIF: Loop c
Model Data:	Display: <input checked="" type="checkbox"/>	Time step: 1	Variable: Salinity	Depth: Surface
Stations:	<input type="checkbox"/> Realtime <input type="checkbox"/> Virtual <input type="checkbox"/> Archive		*Cruises:	<input type="checkbox"/> *M/V Forerunner <input type="checkbox"/> *F/V Piky <input type="checkbox"/> *R/V Wecoma <input type="checkbox"/> *R/V Wecoma Cast
Grid Features:	<input checked="" type="radio"/> None <input type="radio"/> Diffusion Max <input type="radio"/> Grid Bathymetry <input type="radio"/> Nudging values		Grid Layers:	<input type="checkbox"/> Computational grid <input type="checkbox"/> Grid Depths <input type="checkbox"/> Grid Elements <input type="checkbox"/> Grid Nodes <input type="checkbox"/> Land Boundaries <input type="checkbox"/> Open Boundaries

Cruise Mapper

Start date

Year 2007

Month 01

Day 30

Time 00:15

Duration

days 4

Context

[Tides and daylight](#)[*Winds](#)

Source:

Ref forecast

Isolines

Surface salinity

*Vectors

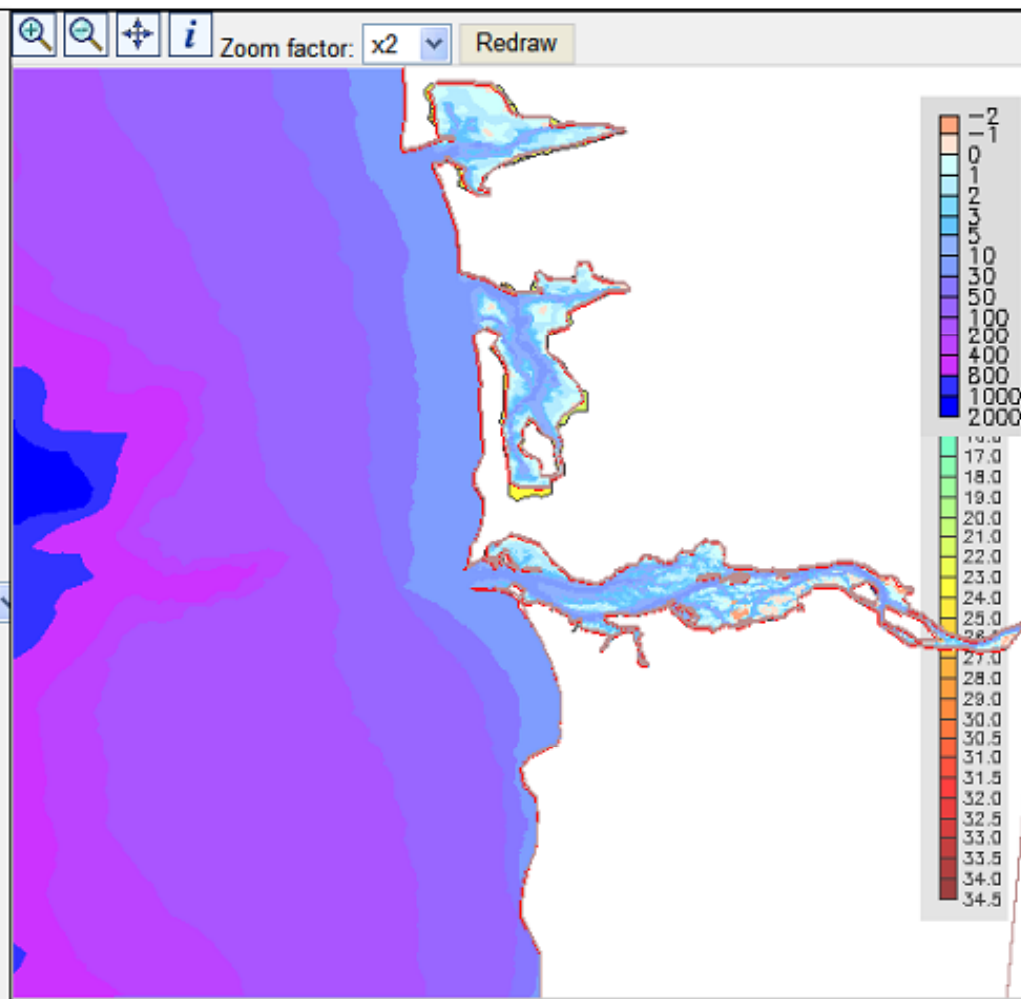
None

*Stations

None

*Transects

None



Legend

Land Boundary

Layers

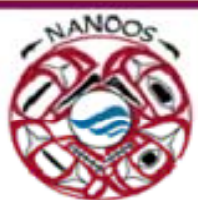
Raster backgrounds

- ☐ None
- ☐ DB11 bathymetry
- ☒ DB14 bathymetry
- ☐ DB16 bathymetry
- ☐ Hires bank to bank
- ☐ NOAA small scale charts
- ☐ NOAA large scale charts
- ☐ USGS DOQs

Transect lines

- ☐ CapeFalcon
- ☐ CapeMeares
- ☐ CapePerpetua

[BPA data page](#)



NANOOS Pilot Project Pacific Northwest estuaries and shores

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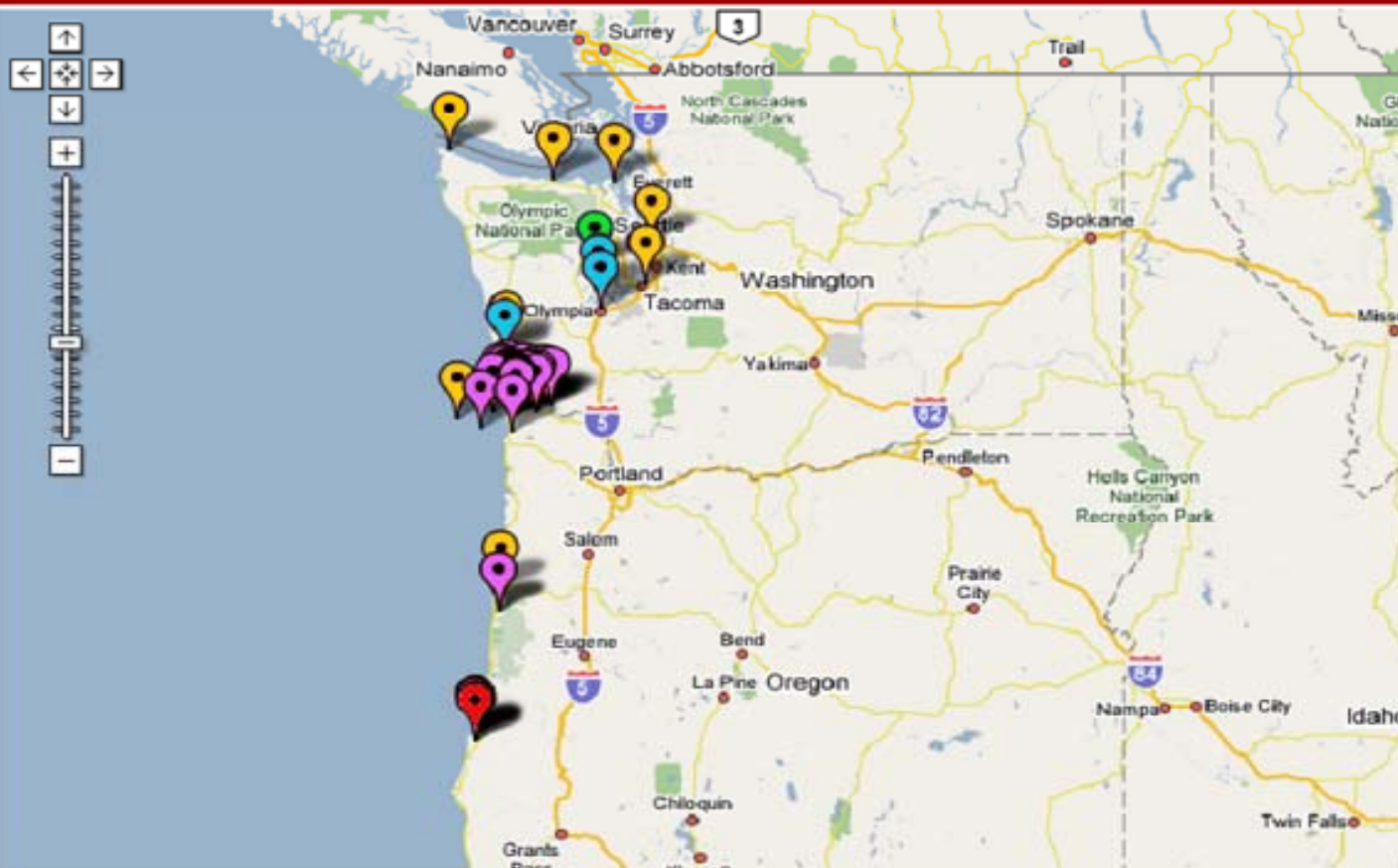
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[ORCA](#)
[PRISM](#)
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External Data

- Model inputs
 - River discharge, River temperature, River elevation
 - Atmospheric Forcings
- Redistribute data from other institutions
- Fetched Daily
 - FTP
 - Screen scraping
 - CGI queries returning ASCII

BON : Bonneville Dam & Lake On Columbia River
Outflow Discharge (KCFS), Daily, Manual Collection (QRDRXZZAZD)

START-DATE			END-DATE		
15 ^	JAN ^	2003 ^	16 ^	JAN ^	2003 ^
16	FEB	2004	17	FEB	2004
17	MAR	2005	18	MAR	2005
18	APR	2006	19	APR	2006
19 v	MAY v	2007 v	20 v	MAY v	2007 v

submit

OPTIONS

Output Format	Export To	Date/Time
HTML v	Screen v	One Column v

Filters

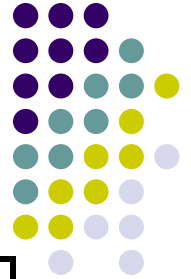
☐ Snap data?
Daily v Base Hour: 00 v (+/-) Window in Min(s): 15 v

☐ Extract Specific Date (Month/Date) across Time-Series
JAN v 16 v

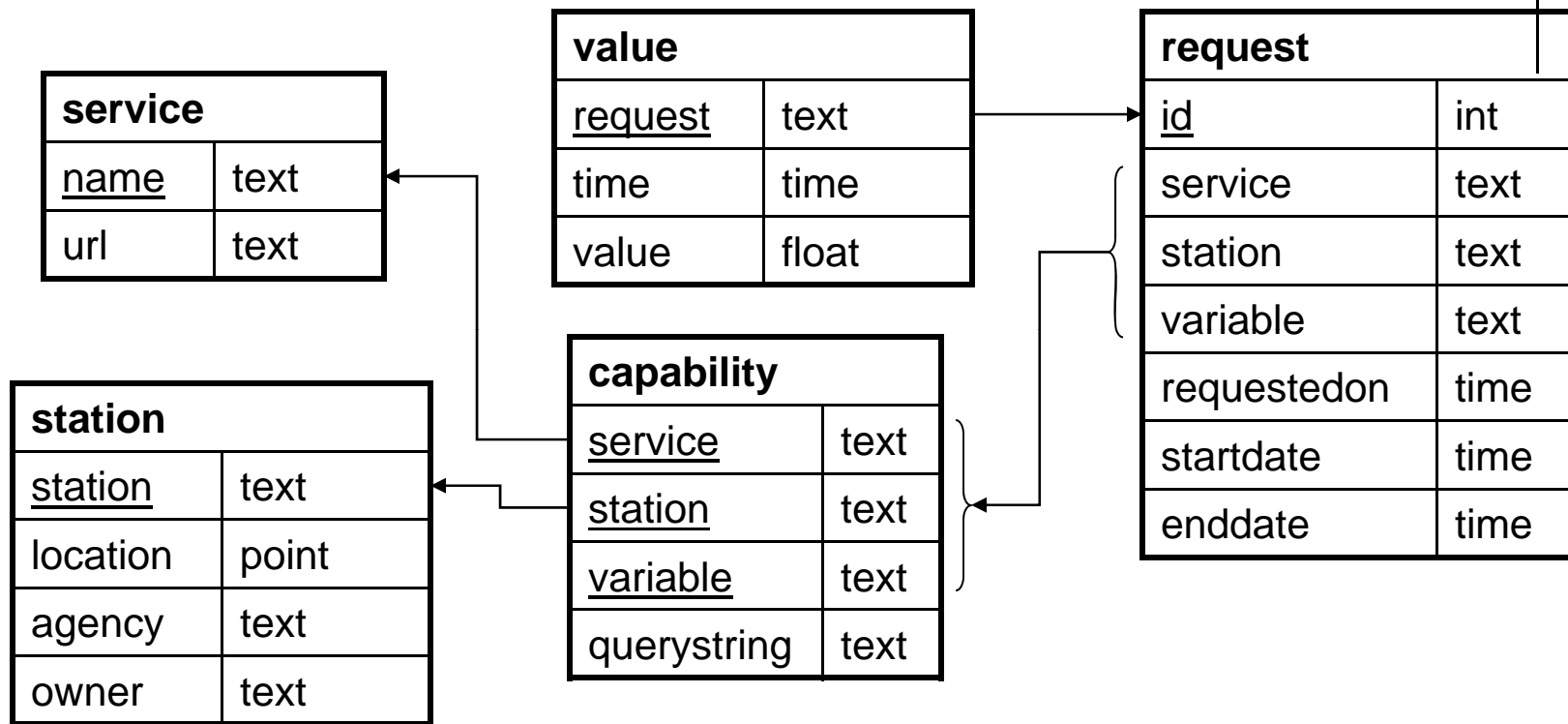
☐ Extract Specific Date Range (Month/Date) across Time-Series
start JAN v 16 v
end JAN v 16 v

☐ Extract Specific Data Range across Time-Series
Less Than Or Equal To v

☐ Exclude Missing data (-901 and -902) from output

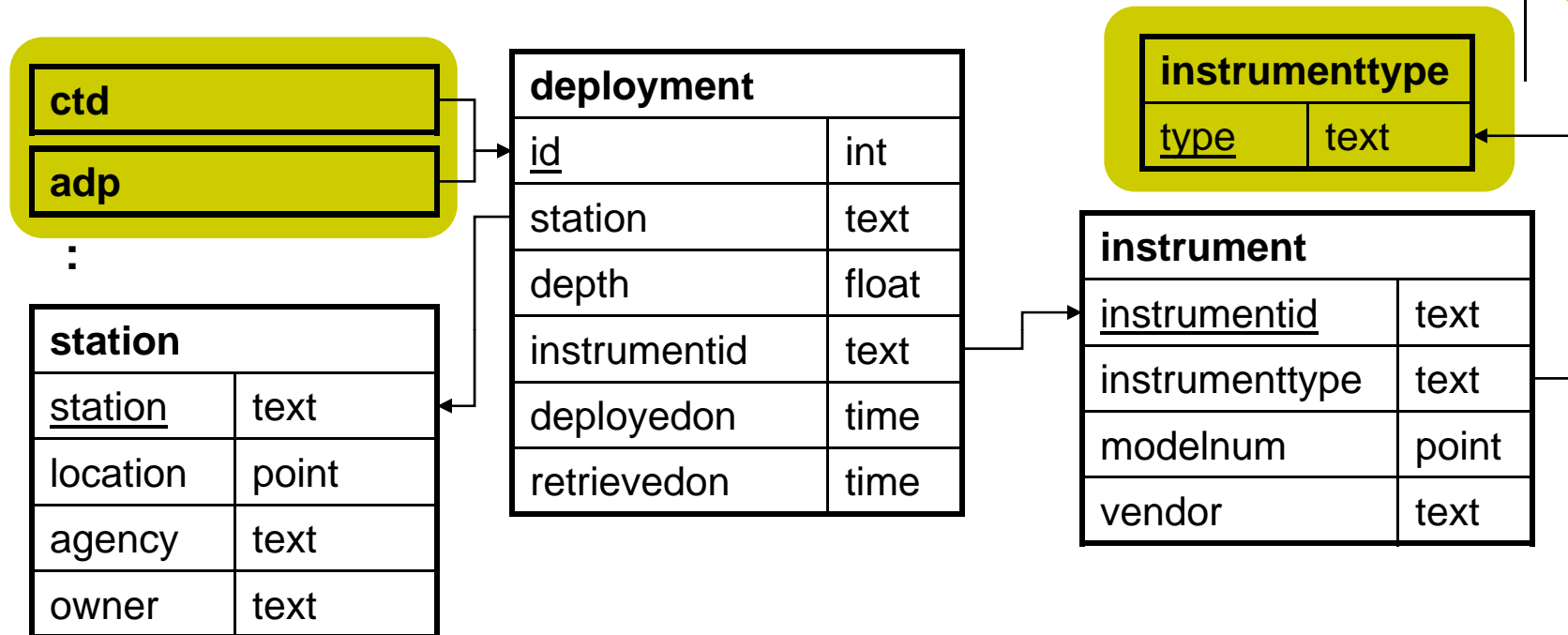
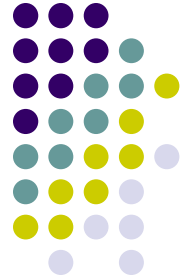


External Data



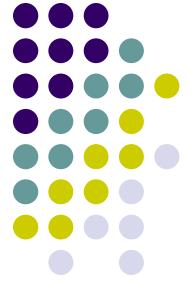
- Script assembles request url and parses result
 - one script per webservice
- Requests may overlap
- Redundant values are filtered out and occasionally deleted

Observations at Fixed Stations



- Tables for specific instrument types
- Deployment is a relationship between a fixed station, an instrument, and a range of time

CTD: Conductivity, Temperature, Depth



- deployment id (FK)
- time
- conductivity, temperature, pressure
- salinity, depth
- battery
- ...
- rawrecord

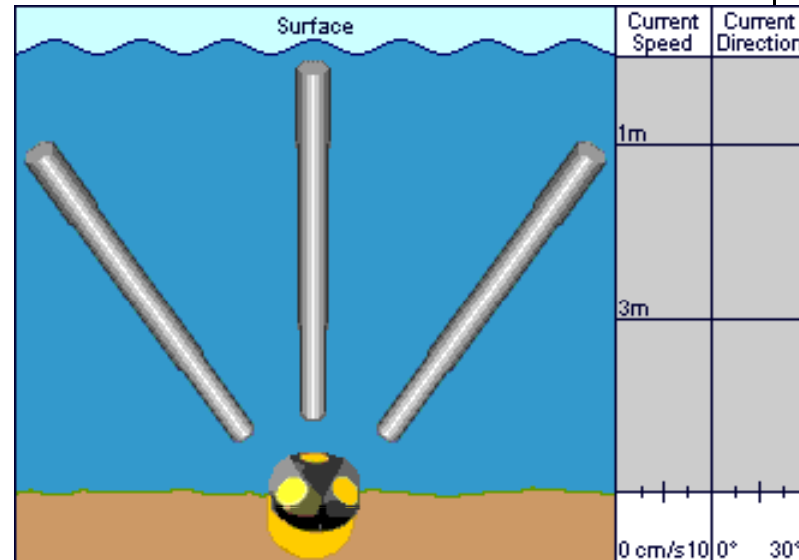


ADP: Acoustic Doppler Profiler



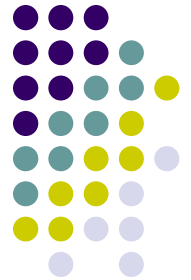
adp	
<u>deploymentid</u>	int
<u>time</u>	int
elevation	float
soundspeed	float
pitch	float
roll	float
...	

adpbin	
<u>adp</u>	text
depth	point
v[3]	text
vstd[3]	text



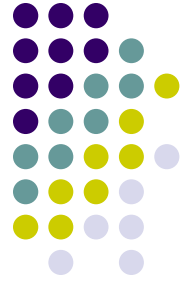
images © SonTek, Inc.

MET: Meterological Station



met	
<u>deploymentid</u>	int
<u>time</u>	int
temperature	float
pressure	float
windspeed	float
winddirection	float
gust	float
humidity	float
rawrecord	text

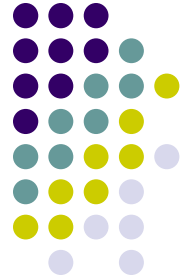




Generalizing

- Data adequately captured, but many queries are awkward and inefficient
- Ex: “What’s the temperature near my ship?”
- Requires a union of model extractions, instrument readings, and downloaded datasets

Generalizing



request	
<u>id</u>	int
service	text
station	text
variable	text
requestedon	time
startdate	time
enddate	time

value	
<u>request</u>	text
time	time
value	float

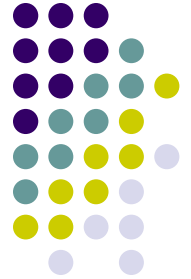
deployment	
<u>id</u>	int
station	int
depth	float
instrumentid	text
deployedon	time
retrievedon	time

met	
<u>deploymentid</u>	int
<u>time</u>	int
temperature	float
pressure	float
windspeed	float
winddirection	float
gust	float
humidity	float
rawrecord	text

result	
resultid	text
runid	text
variable	text

extraction	
resultid	text
value	float

Generalizing (2)



(x,y)

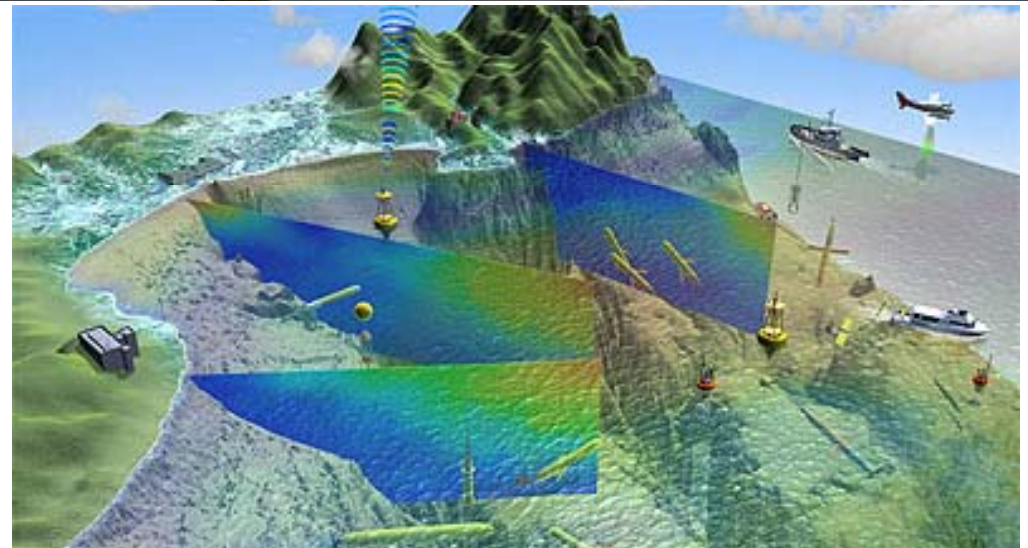
(z)

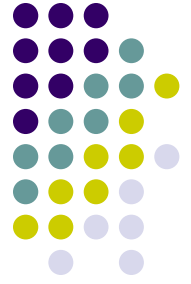
(t)

(v)

dataset	
<u>id</u>	int
station	int
variable	text
depth	float
starttime	time
endtime	time

value	
<u>datasetid</u>	int
<u>time</u>	time
value	float





Generalizing (3)

dataset	
<u>datasetid</u>	int
variable	text
units	text

tag	
<u>datasetid</u>	int
property	text
value	text

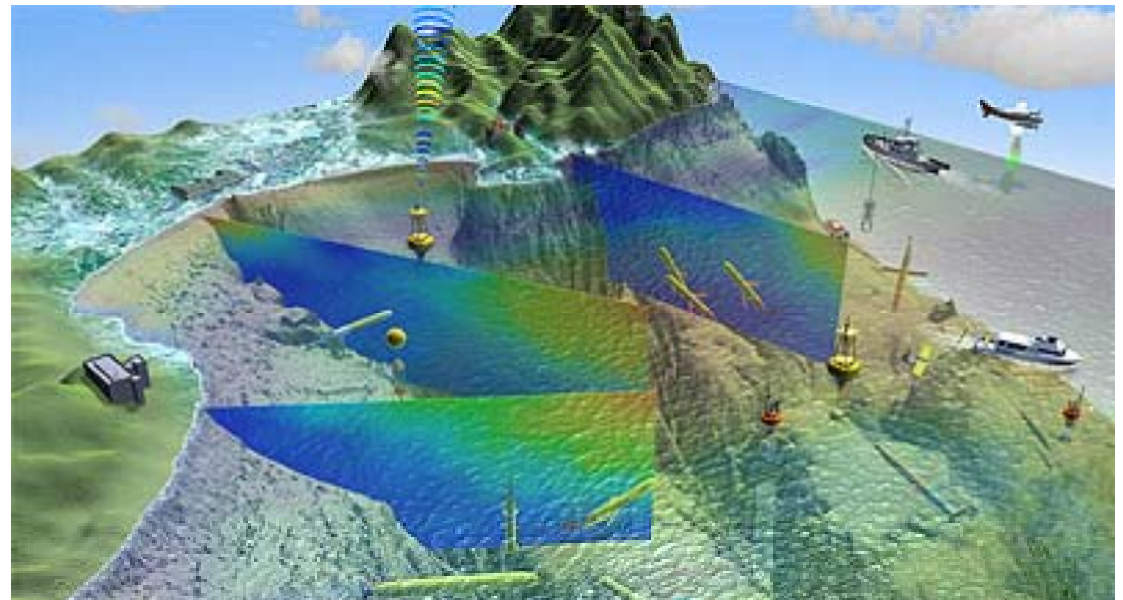
value	
<u>datasetid</u>	int
<u>location</u>	point
<u>depth</u>	float
<u>time</u>	time
value	float

(x,y)

(z)

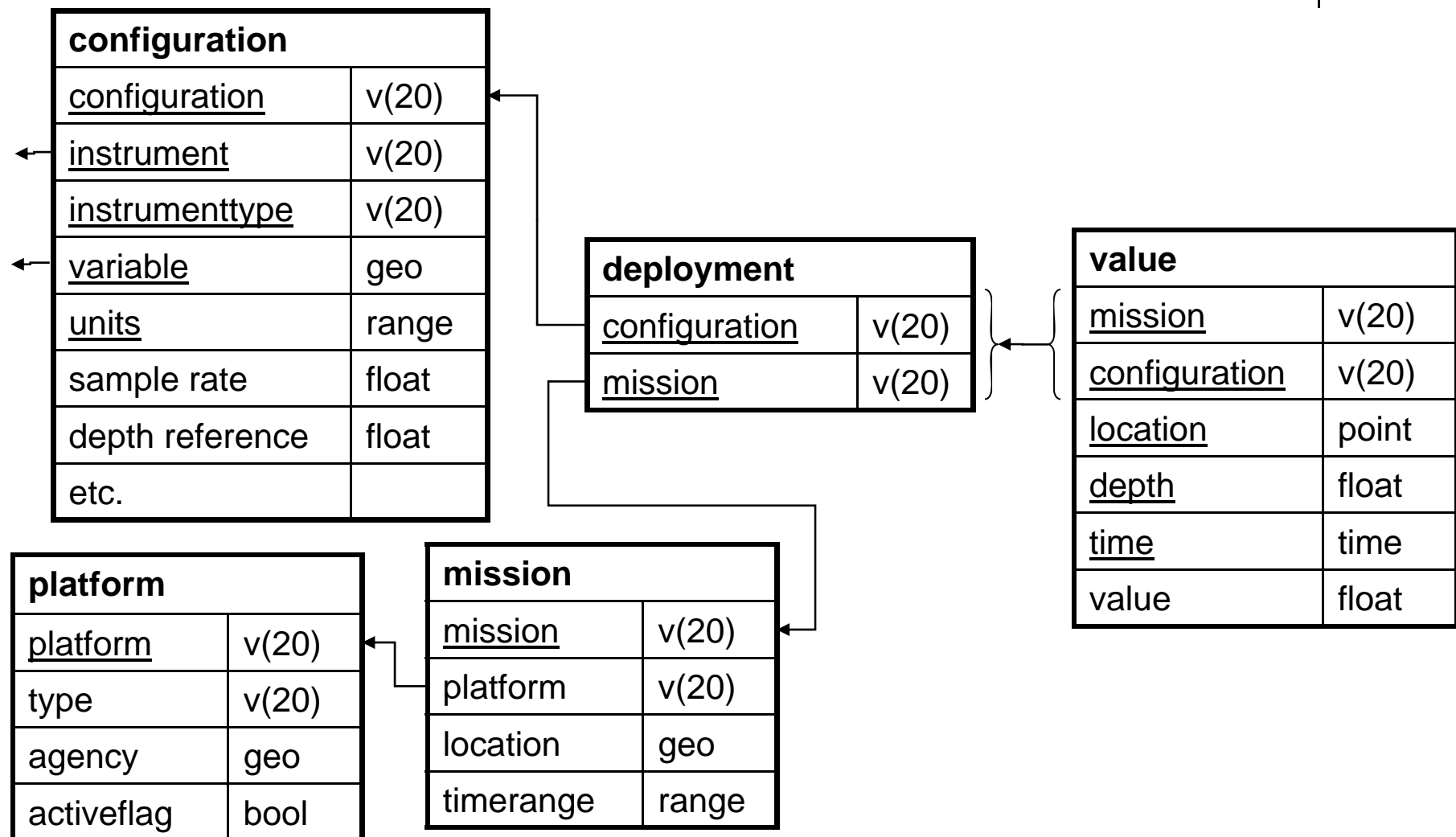
(t)

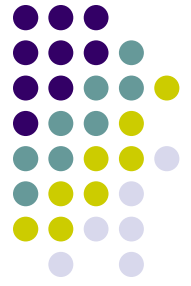
(v)





Integrated Schema





Example: Fixed Stations

- **Platform**
 - One per station, e.g., 'red26'
- **Mission**
 - One begins at each visit
 - Stores a spacetime 'Envelope'; a single point in this case.
- **Configuration**
 - One per (instrument, variable)
 - Can be reused on multiple missions
- **Deployment**
 - assignment of a configuration to a mission
- **Value**
 - measurements redundantly store the location information



Example: Forerunner



- **Platform**

- The forerunner itself,
- maybe the cast devices are separate

- **Mission**

- One for each cruise
- Envelope is the cruise plan as a PostGIS linestring

- **Configuration / Deployment**

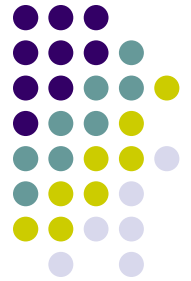
- Sample rate, cast protocol, etc.

- **Value**

- Time/Location changes with each measurement



Example: Oceanic Remote Chemical-optical Analyzer



- **Platform**

- The ORCA mooring itself

- **Mission**

- One for each of 3 long-term deployments
- Envelope is a single point

- **Configuration / Deployment**

- Sample rate, cast protocol, etc.

- **Value**

- Location: local drift is ignored
- Time: estimated from sample rate and profile time
- Depth: estimated from pressure and latitude with a postgres UDF

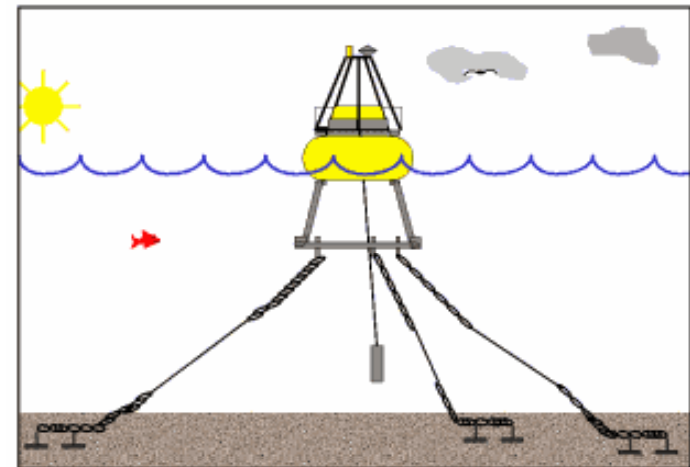
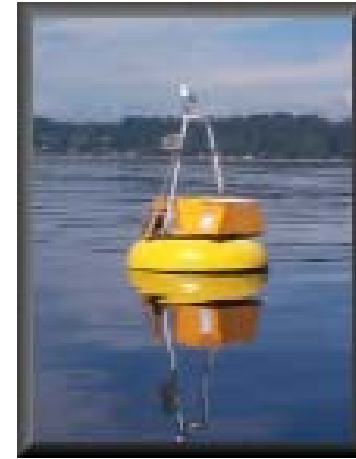
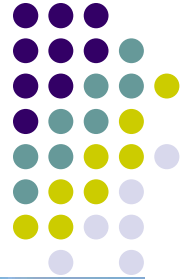


image source: <http://www.ocean.washington.edu/research/orca/>

Example: Unmanned Underwater Vehicles



- **Platform**
 - The vehicle
- **Mission**
 - Each excursion is a mission
 - Envelope is a linestring
- **Configuration / Deployment**
 - Frequent changes
- **Value**
 - Location, depth, and time all vary

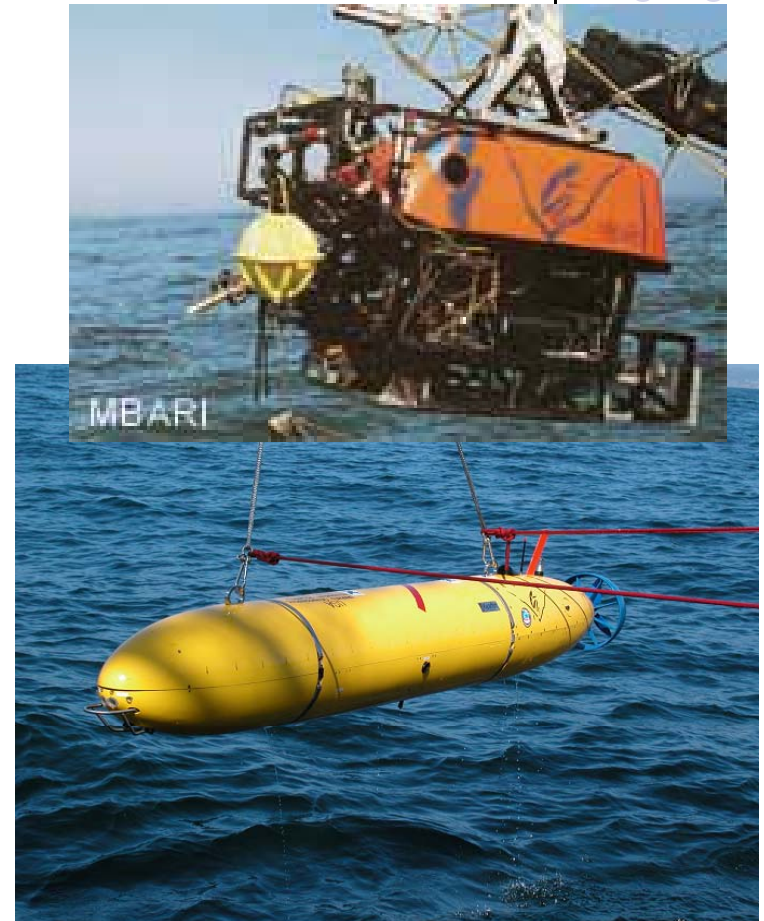


image source: <http://www.mbari.org/auv/>



Example: External Data

- **Platform**
 - Each site or service
- **Mission**
 - Fine-grained: each request
 - Coarse-grained: each feed
- **Instrument**
 - Program used for retrieval
- **Configuration / Deployment**
 - Command-line arguments
- **Value**
 - Location, depth, and time may vary

BON : Bonneville Dam & Lake On Columbia River
Outflow Discharge (KCFS), Daily, Manual Collection (QRDRXZZAZD)

START-DATE			END-DATE		
15	JAN	2003	16	JAN	2003
16	FEB	2004	17	FEB	2004
17	MAR	2005	18	MAR	2005
18	APR	2006	19	APR	2006
19	MAY	2007	20	MAY	2007

submit

OPTIONS

Output Format	Export To	Date/Time
HTML	Screen	One Column

Filters

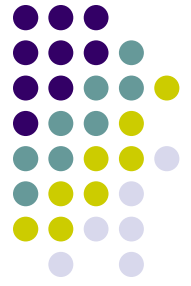
☐ Snap data?
Daily Base Hour: 00 (+/-) Window in Min(s): 15

☐ Extract Specific Date (Month/Date) across Time-Series
JAN 16

☐ Extract Specific Date Range (Month/Date) across Time-Series
start JAN 16
end JAN 16

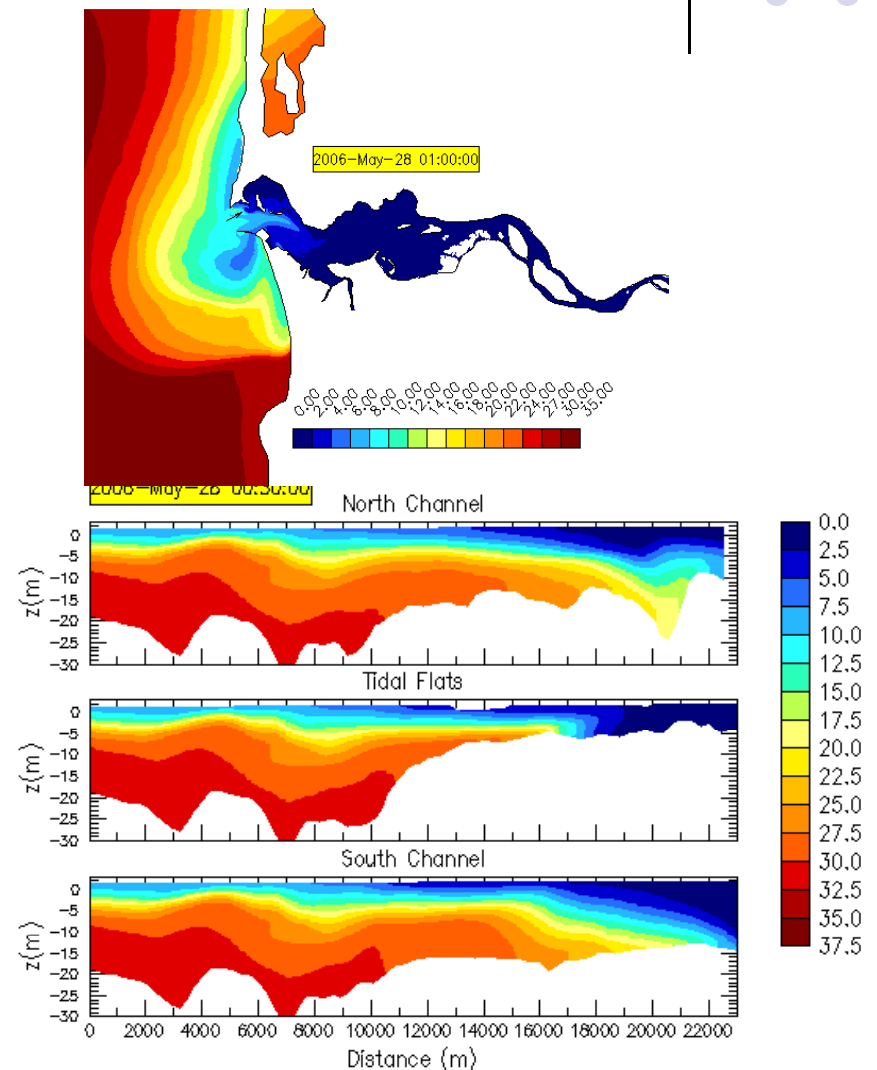
☐ Extract Specific Data Range across Time-Series
Less Than Or Equal To

☐ Exclude Missing data (-901 and -902) from output



Example: Model Extractions

- **Platform**
 - Each model: ELCIRC, SELFE
- **Mission**
 - A sequence of related runs
 - e.g, “Tilamook forecast”
- **Instrument**
 - “Virtual Instruments”
- **Configuration / Deployment**
 - Command-line arguments
- **Value**
 - Location, depth, and time may vary



Model Extractions Only



~1M values per timestep

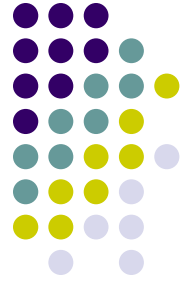
* 96 timesteps per day

* 365 days per year

* ~8 years

* ~100 bytes

= 28 TB per “mission”



Containment in SpaceTime

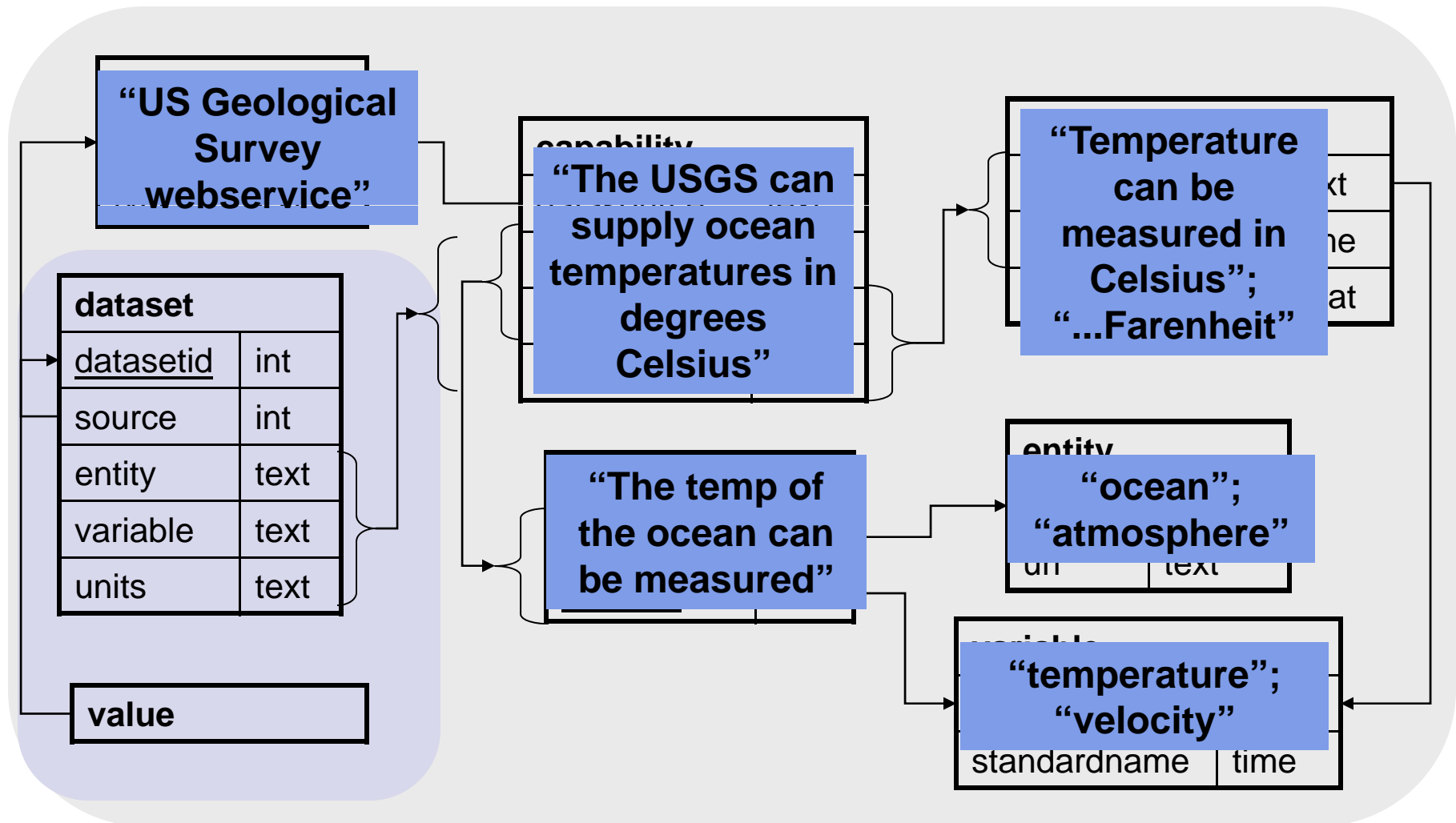
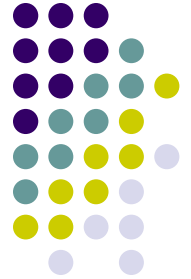
- Platform may have a fixed location e.g., permanent moorings
- If not, the mission may be to a fixed location e.g., ORCA
- If not, the deployment may be at a fixed location e.g., Casts
 - If not, each measurement may be at a different location e.g., UUVs

Defaults cascade upwards

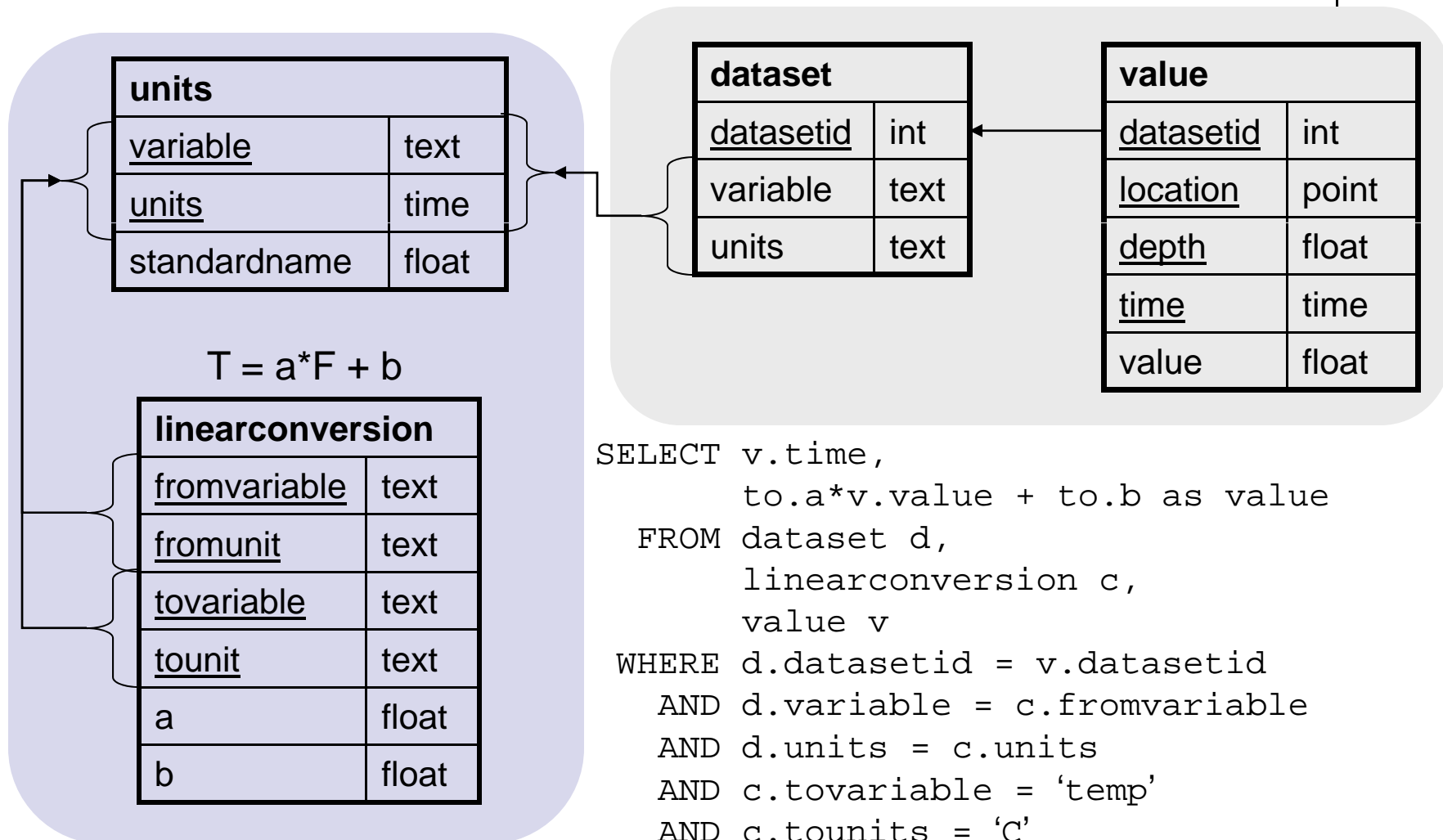
Parent location contains its children's locations if not null.

Question: Implementation in PostgreSQL?

Other Generalizations: Measurable Quantities



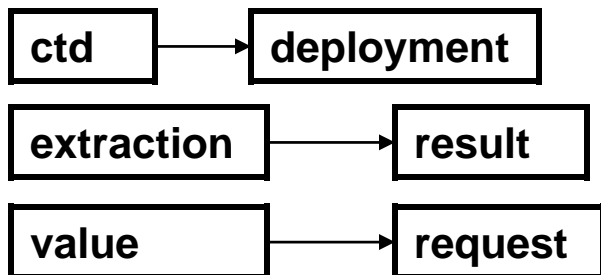
Other Generalizations: Unit Conversions



Tradeoffs



schema complexity

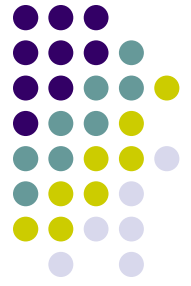


```
SELECT c.salt
  FROM deployment d, ctd c
 WHERE c.deployment = d.id
    AND c.time BETWEEN ? AND ?
    AND d.station = 'red26'
```

application complexity

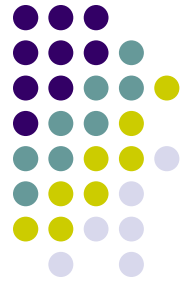


```
SELECT v.value
  FROM dataset d,
        tag t,
        value v
 WHERE t.dataset = d.id
    AND v.dataset = d.id
    AND t.name = 'station'
    AND t.value = 'red26'
    AND d.variable = 'salt'
    AND v.time BETWEEN ? AND ?
```



Recap

- Schema design is the fundamental activity
 - An expensive exercise
 - little intrinsic value
 - Poor adaptability
 - Permanently too general or too specific
 - Same goes for ontology/controlled vocabulary/standard
- Some queries are slow and complicated
 - Sets are good for ad hoc selection
 - Arrays are better for “neighborhood” queries
 - 1d Example: When did the temperature drop by more than 3 degrees from the previous measurement?
- But several useful capabilities (next slides)



Relational Database History

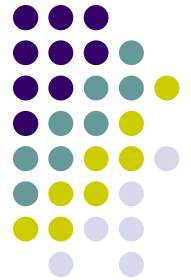
Pre-Relational: if your data changed, your application broke.

Early RDBMS were buggy and slow (and often reviled), but required only 5% of the application code.

“Activities of users at terminals and most application programs should remain unaffected when the internal representation of data is changed and even when some aspects of the external representation are changed.” -- Codd 1979

Key Ideas: Programs that manipulate tabular data exhibit an algebraic structure allowing reasoning and manipulation independently of physical data representation

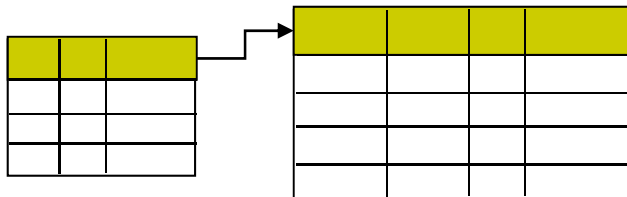
Key Idea: Data Independence



views

```
SELECT *  
FROM my_sequences
```

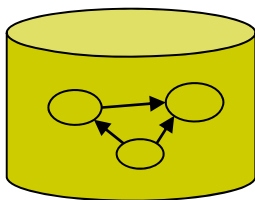
logical data independence



relations

```
SELECT seq  
FROM ncbi_sequences  
WHERE seq = 'GATTACGATATTA';
```

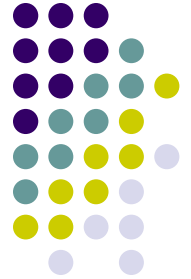
physical data independence



files and
pointers

```
f = fopen('table_file');  
fseek(10030440);  
while (True) {  
    fread(&buf, 1, 8192, f);  
    if (buf == GATTACGATATTA) {
```

Key Idea: Indexes



- Databases are especially, but exclusively, effective at “Needle in Haystack” problems:
 - Extracting small results from big datasets
 - Transparently provide “old style” scalability
 - Your query will **always*** finish, regardless of dataset size.
- Indexes are easily built and automatically used when appropriate

```
CREATE INDEX seq_idx ON sequence(seq);
```

```
SELECT seq  
FROM sequence
```

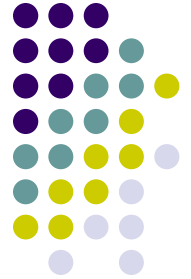
```
WHERE seq = 'GATTACGATATTA';
```

Key Idea: Bring the Computation to the Data



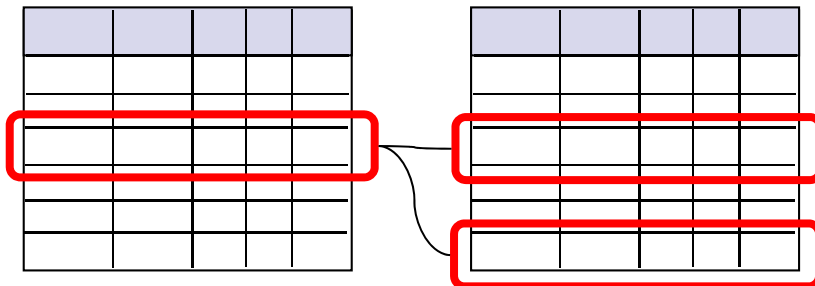
- It is no longer feasible to have users download data to their desktop for processing
- QLs push the computation down into the database
- Natural extension: data born in the cloud and stays there forever
 - Computation comes and goes

Key Idea: An *Algebra of Tables*



select

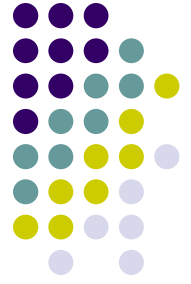
project



join

Other operators: aggregate, union, difference, cross product

Key Idea: Algebraic Optimization



$$N = ((z*2)+((z*3)+0))/1$$

Algebraic Laws:

1. (+) identity: $x+0 = x$
2. (/) identity: $x/1 = x$
3. (*) distributes: $(n*x+n*y) = n*(x+y)$
4. (*) commutes: $x*y = y*x$

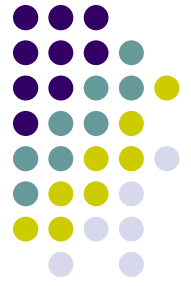
Apply rules 1, 3, 4, 2:

$$N = (2+3)*z$$

two operations instead of five, no division operator

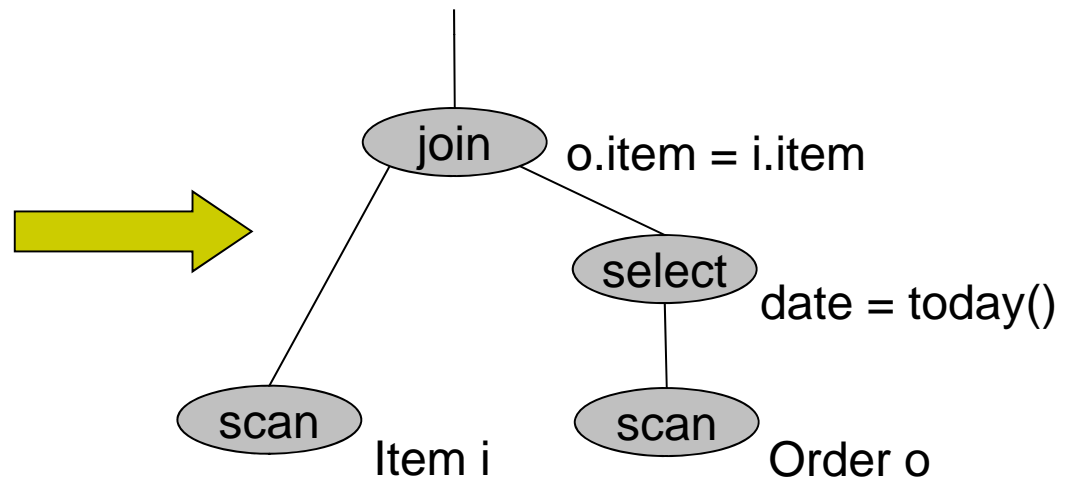
Same idea works with the Relational Algebra!

Key Idea: Declarative Languages

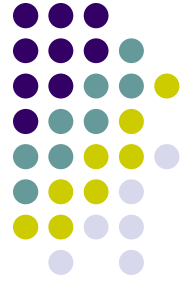


Find all orders from today, along with the items ordered

```
SELECT *  
  FROM Order o, Item i  
 WHERE o.item = i.item  
    AND o.date = today()
```



Key Idea: User-defined types and functions



```
SELECT salinity(temperature, conductivity) FROM CTD
```

```
SELECT * FROM FetchCTD(today())
```

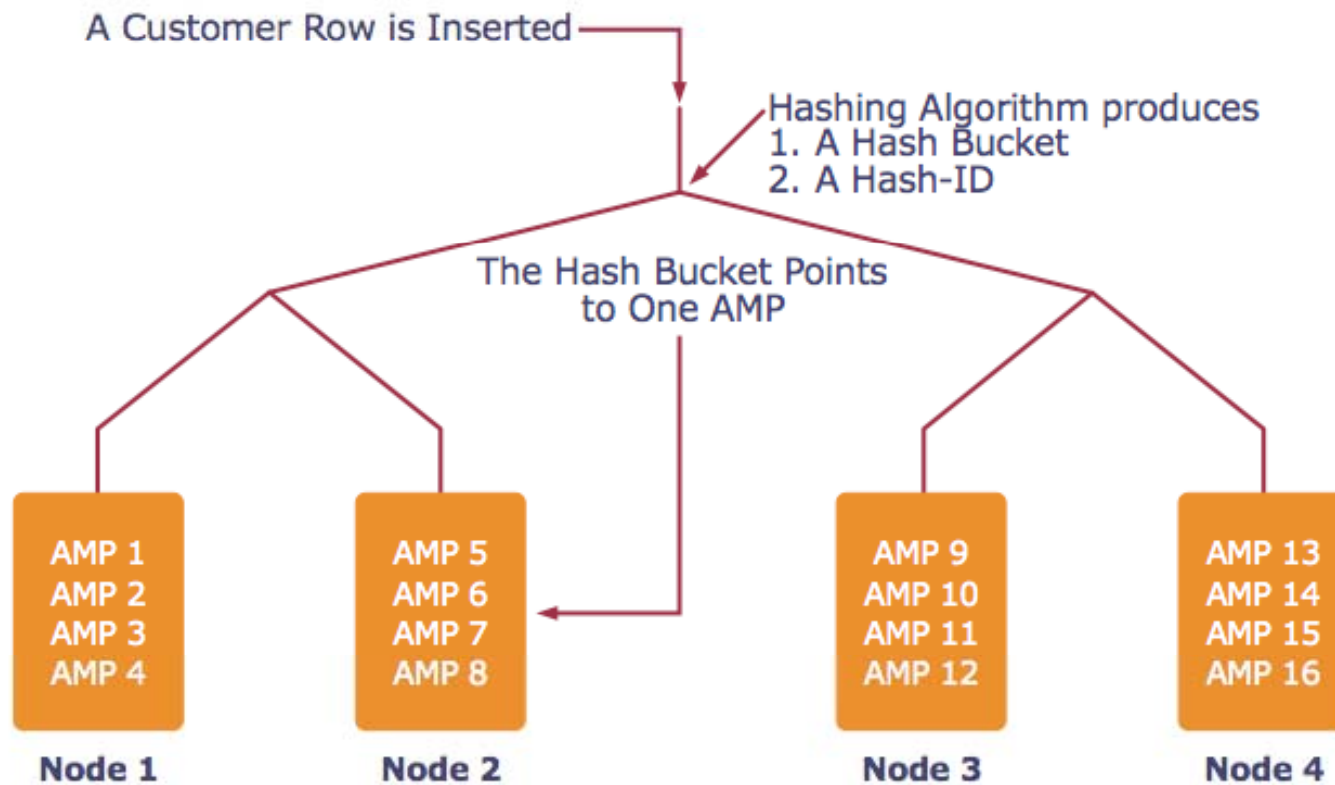
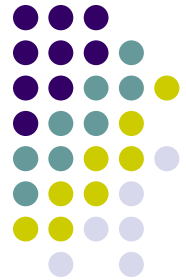
```
SELECT date, median(salt) FROM CTD GROUP BY date
```



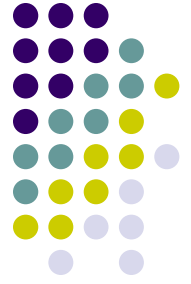
Current Topics

- Parallel
 - “SQL is the world’s most popular parallel language”
 - Teradata, Greenplum, Netezza, Aster, Datallegro (now owned by MS)
- Column-oriented
 - Vertica, MonetDB
- Array-oriented
 - SciDB, RasDaMan
- Trees, Meshes, Graphs, Streams,
- Schema-free or schema-later approaches

Example Parallel System: Teradata



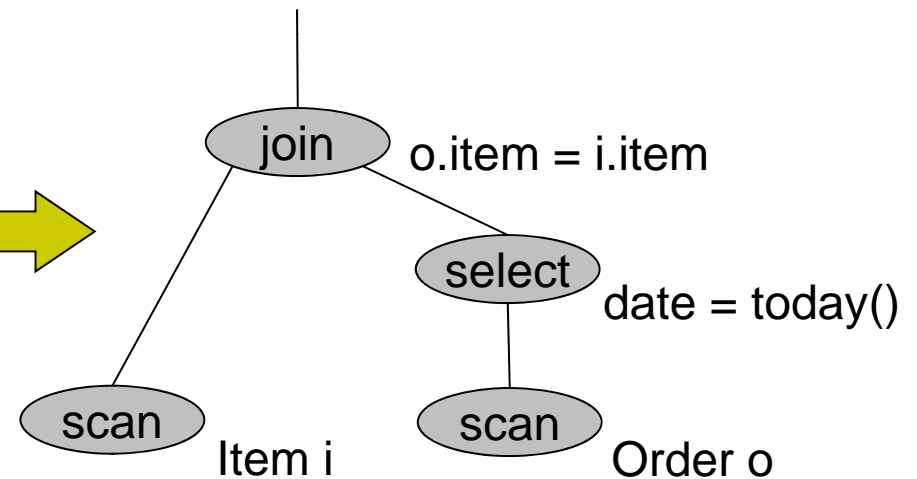
AMP = unit of parallelism

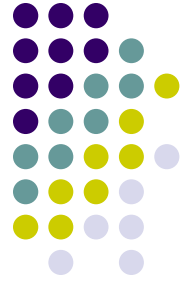


Example System: Teradata

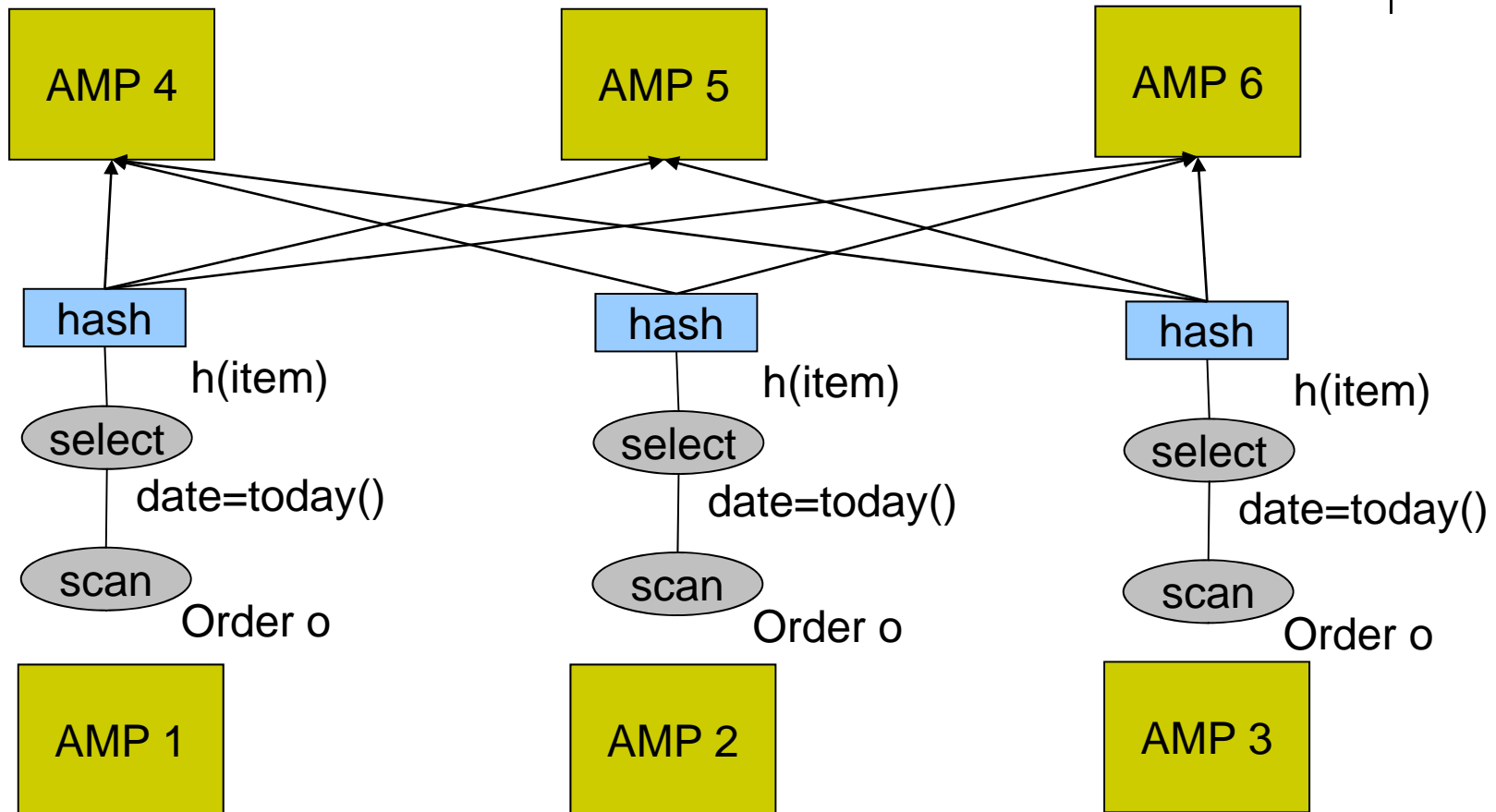
Find all orders from today, along with the items ordered

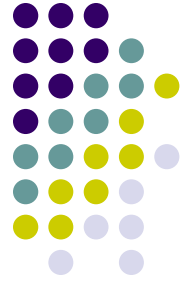
```
SELECT *  
  FROM Orders o, Lines i  
 WHERE o.item = i.item  
    AND o.date = today()
```



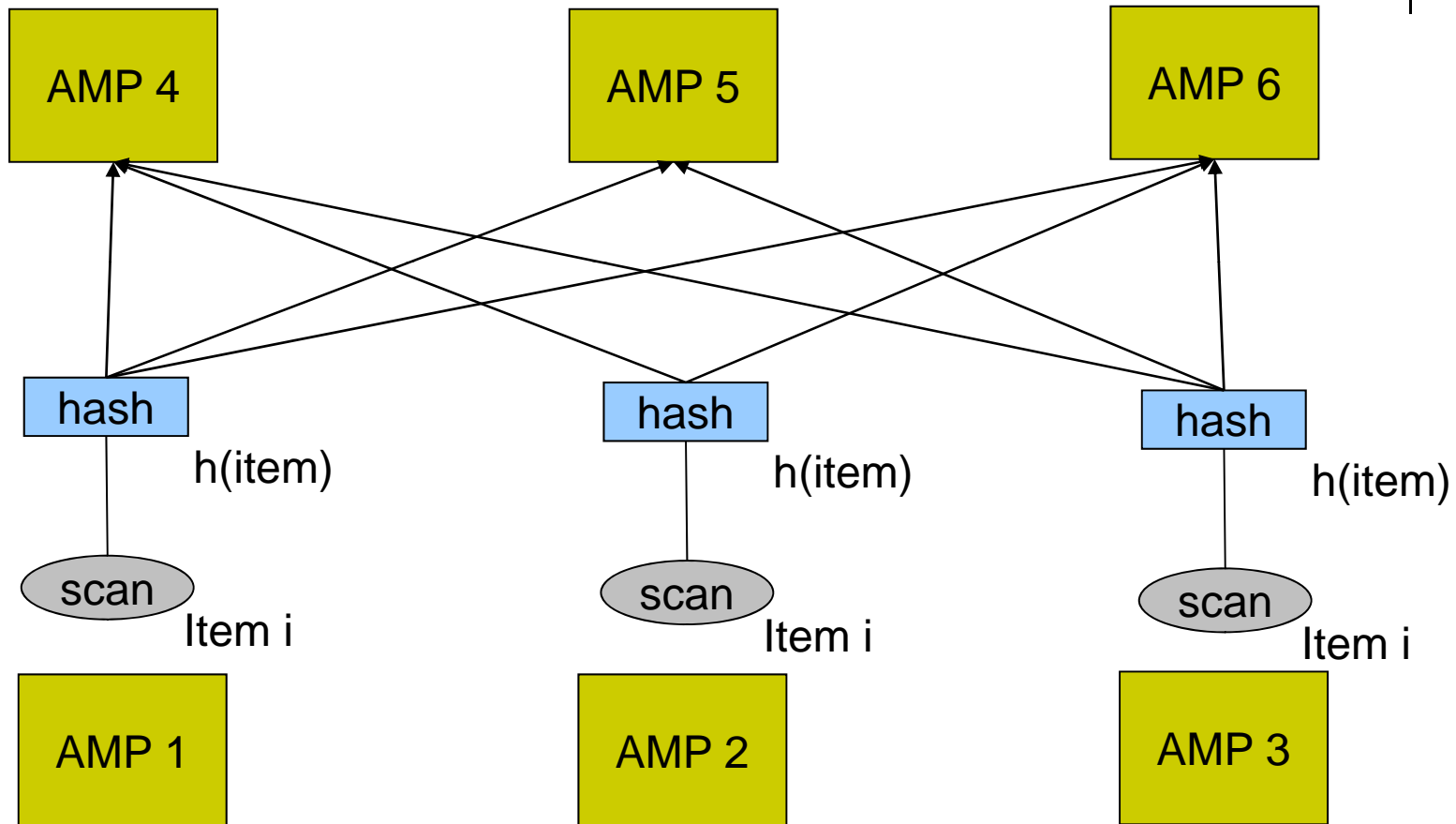


Example System: Teradata



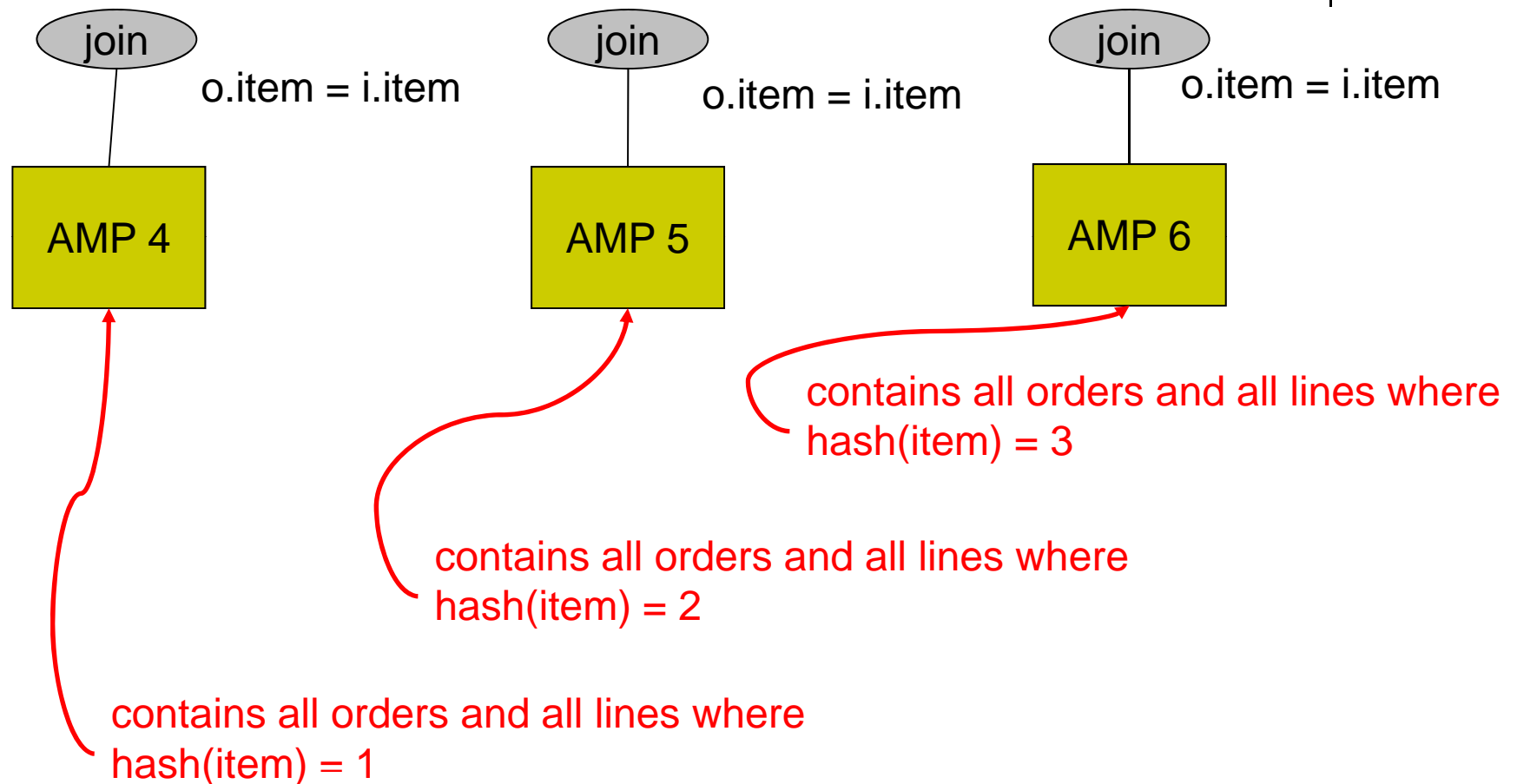


Example System: Teradata





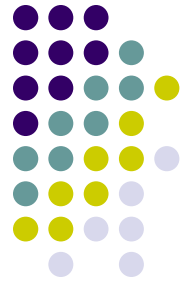
Example System: Teradata





Views

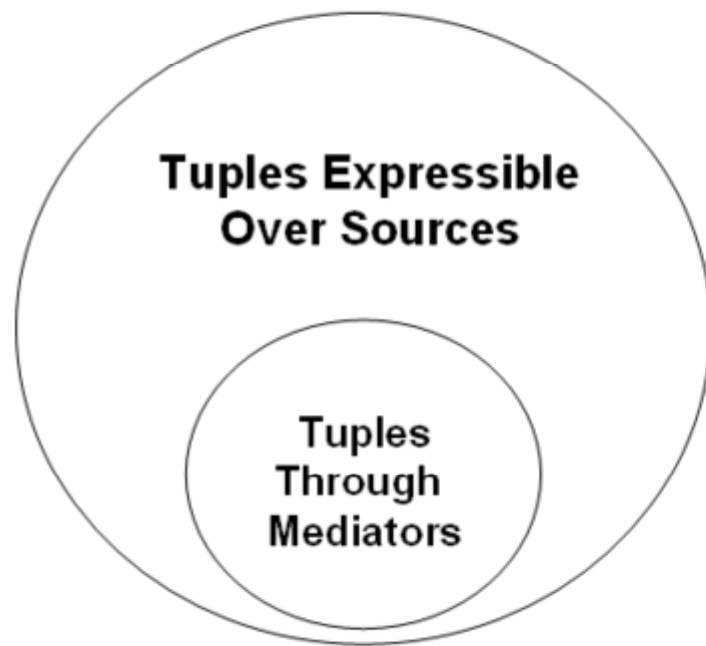
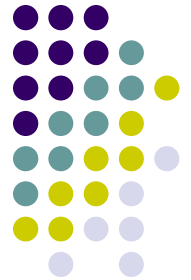
- Push logic into the database
 - Single point of control
 - Encourages reuse
 - One problem: no source control
- Deployment Tool
 - Implement legacy schema with views
 - Legacy applications can be rewired incrementally



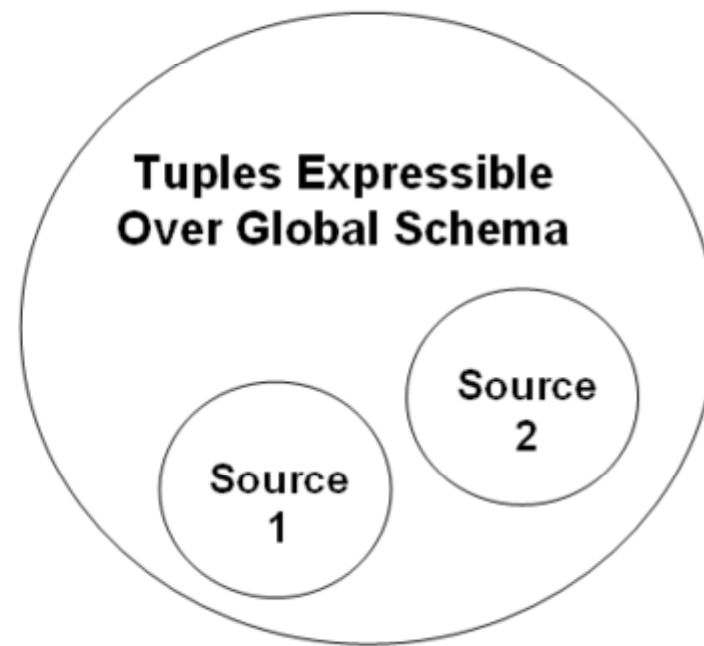
Views applied

- Views for legacy schemas
 - bontemp = temperature data at Bonneville Dam
- Views for simplifying php code
 - “forecast dashboard”
 - Complex aggregates, filters, transformation
 - Hide the complex SQL behind a view
- Views for the integrated schema
 - GAV vs. LAV both conceptually valid
 - Reality: GAV leads to performance problems
 - Union is an expensive operator; Postgresql has no parallel query evaluation.

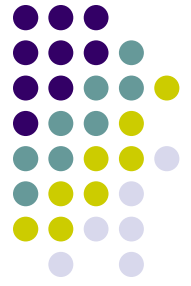
GAV vs. LAV



Global As View



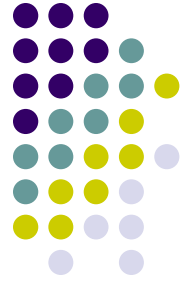
Local As View



Materialized Views

- What's a view?
 - A named query
 - re-executed at runtime
 - may be compiled
- Oracle and IBM obliterated TPC-D benchmarks in late 1998
- Oracle offered \$1M to anyone who could show that MS SQL Server was within two orders of magnitude of Oracle on TPC-D

cheaters!

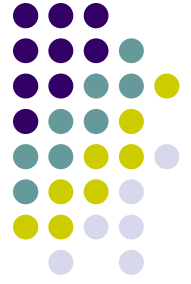


Materialized Views (cont'd)

- How are they implemented in PostgreSQL?
 - Ordinary tables,
 - populated by rules, triggers, maybe cron jobs
- At CMOP:
 - Integrated Schema is a “Materialized View” over the legacy schemas
 - Populated by rules on the legacy schemas

Question: What's the difference between a Rule and a Trigger?

Geography (e.g., PostGIS)



- Three Contributions:

- User Defined Types

- Point
 - Line
 - Polygon
 - more

- User Defined Functions

- $x(g)$, $y(g)$, $\text{bbox}(g)$, $\text{centroid}(g)$, ,
 $\text{distance}(g,g)$, etc.
 - $\text{overlaps}(g,g)$, $\text{contains}(g,g)$, etc.

- Geo-referencing

